

# From Big Data to Big Control: Closing Feedback Loops around Large-scale Infrastructure Data

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# Control of Complex Systems Initiative: From Big Data to Big Controls

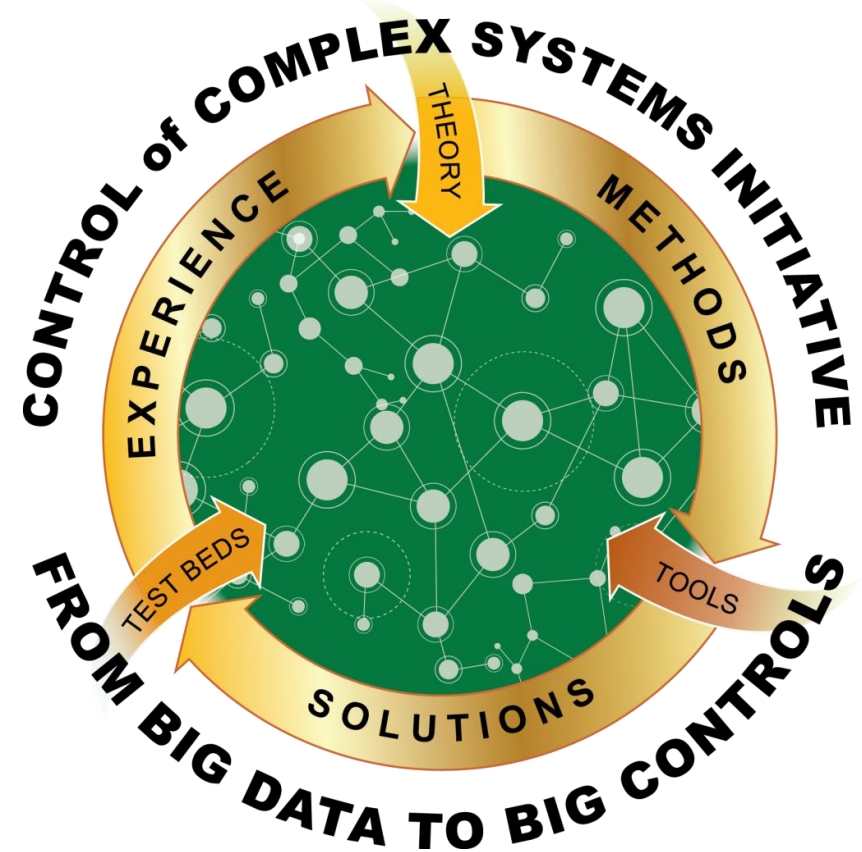
**CCSI:** A five year, multi-million dollar internal research investment to build and demonstrate development and delivery of best of class solutions for problems in the control of complex systems.

## Challenges for Big Controls:

- ▶ Large numbers of sensing and/or control end points
- ▶ Multiple scales of operation usually with multiple time scales
- ▶ Node heterogeneity
- ▶ Pervasive computing/autonomous nodes

## Control solutions will be:

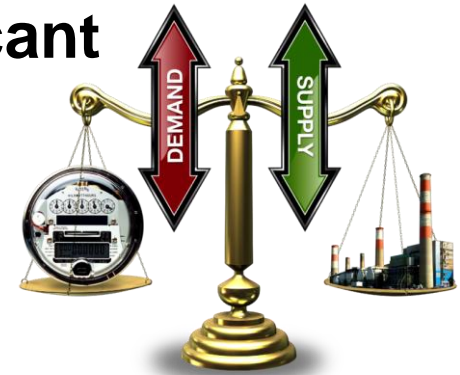
*Scalable, deployable, robust, resilient, and adoptable.*



# Significant Challenges Facing the Grid

**The challenges facing the grid are significant and in tension with each other**

- ▶ Maintain and increase reliability
- ▶ Integrate renewables & low-carbon sources
- ▶ Potential electrification of vehicle transportation (& other end uses as electricity becomes the preferred “fuel”)
- ▶ Increase asset utilization, reduce capacity for peak loads
- ▶ ***While keeping costs & revenues as low as possible***



**Smart grid is the most promising approach to addressing these challenges simultaneously**

- ▶ Much of smart grid's promise lies in distributed assets: Demand response, distributed storage & generation, electric vehicles, smart inverters

# Future Control Architecture of the Grid

**Designing a novel control architecture for the power grid needs a significant number of considerations, e.g.:**

- ▶ Laws of electro-physics must be observed
- ▶ Current/future stakeholder boundaries must be respected
- ▶ Architecture must be deployable in a modular, incremental fashion
- ▶ For reasons of robustness, resilience & flexibility, the control architecture must be layered
- ▶ Considering the huge number of assets, lowest layer must be a *distributed control architecture*

***Transactive Controls*** is a very promising approach for such a distributed control architecture

# Transactive Controls / Transactive Energy

Refers to *techniques for managing the generation, consumption or flow of electricity* within a power system, *using economic or market-based constructs*, while *respecting grid reliability constraints*.

The term “*transactive*” comes from considering that *decisions are made based on a value*. These decisions may be analogous to, or literally, economic transactions.

Transactive Energy Workshop Proceedings 2012, prepared by the GridWise® Architecture Council, March 2012, PNNL-SA-90082 (<http://www.gridwiseac.org/historical/tew2012/tew2012.aspx>)

# What Problems or Issues is Transactive Control and Coordination Designed to Address?



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# Principal Challenges Addressed by TC2

Principal Challenge	Approach
<ul style="list-style-type: none"><li>▶ Centralized optimization is unworkable<ul style="list-style-type: none"><li>■ <i>for such large numbers of controllable assets, e.g. <math>\sim 10^9</math> for full demand response participation</i></li></ul></li></ul>	<ul style="list-style-type: none"><li>▶ Distributed approach with self-organizing, self-optimizing properties of market-like constructs</li></ul>
<ul style="list-style-type: none"><li>▶ Interoperability</li></ul>	<ul style="list-style-type: none"><li>▶ Simple information protocol, common between all nodes at all levels of system: <i>quantity, price or value, &amp; time</i></li></ul>
<ul style="list-style-type: none"><li>▶ Privacy &amp; security<ul style="list-style-type: none"><li>■ <i>due to sensitivity of the data required by centralized techniques</i></li></ul></li></ul>	<ul style="list-style-type: none"><li>▶ Minimizes risks &amp; sensitivities by limiting content of data exchange to simple transactions</li></ul>
<ul style="list-style-type: none"><li>▶ Scalability</li></ul>	<ul style="list-style-type: none"><li>▶ Self-similar at all scales in the grid</li><li>▶ Common paradigm for control &amp; communication among nodes of all types</li><li>▶ Ratio of parent to child nodes limited to <math>\sim 10^3</math></li></ul>



# Principal Challenges Addressed by TC2 (cont.)

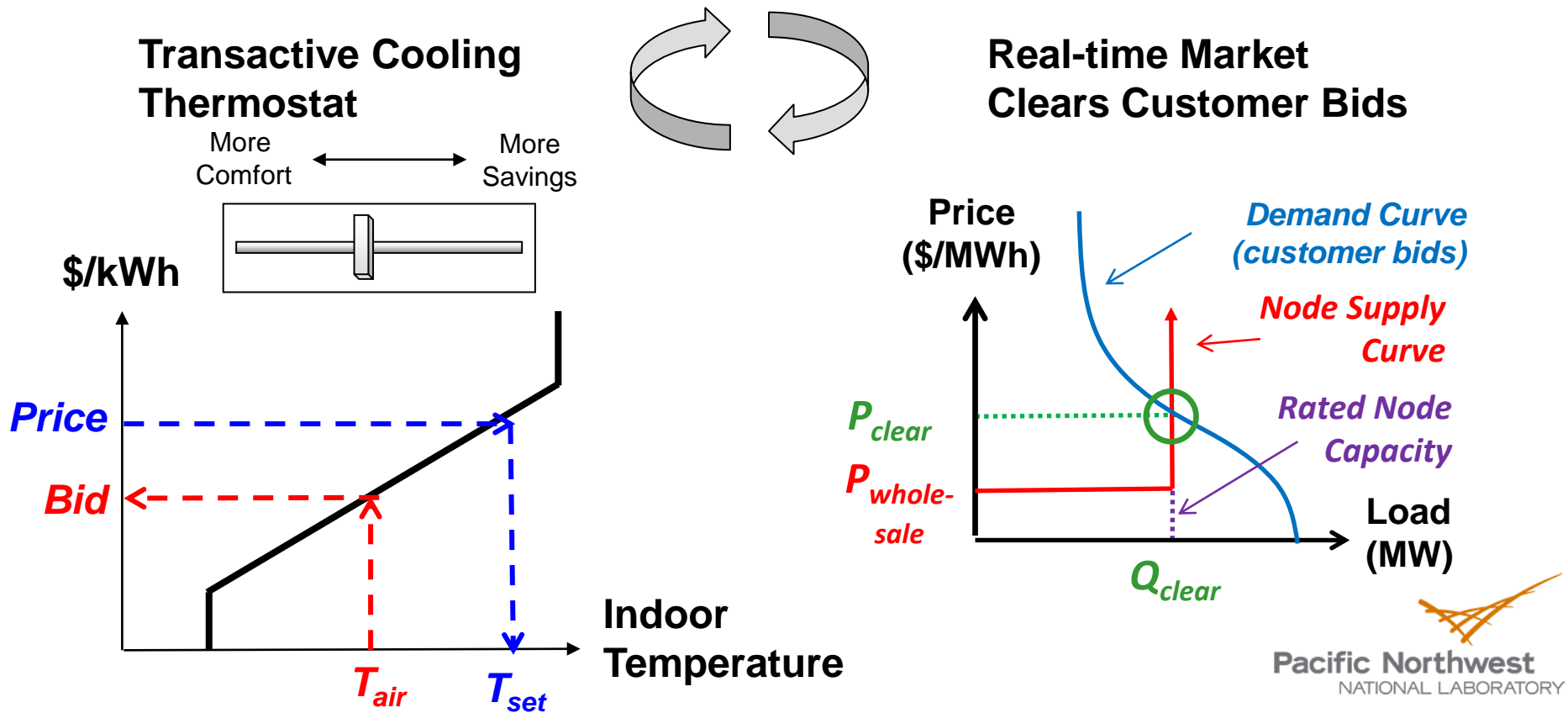
Principal Challenge	Approach
<ul style="list-style-type: none"> <li>▶ Level playing field for all assets of all types: <ul style="list-style-type: none"> <li>■ <i>existing infrastructure &amp; new distributed assets</i></li> </ul> </li> </ul>	<ul style="list-style-type: none"> <li>▶ Market-like construct provides equal opportunity for all assets</li> <li>▶ Selects lowest cost, most willing assets to “get the job done”</li> </ul>
<ul style="list-style-type: none"> <li>▶ Maintain customer autonomy <ul style="list-style-type: none"> <li>■ <i>“Act locally but think globally ...”</i></li> </ul> </li> </ul>	<ul style="list-style-type: none"> <li>▶ Incentive-based construct maintains free will <ul style="list-style-type: none"> <li>■ <i>customers &amp; 3rd-parties fully control their assets</i></li> <li>■ <i>yet collaborate (<u>and get paid for it</u>)</i></li> </ul> </li> </ul>
<ul style="list-style-type: none"> <li>▶ Achieving multiple objectives with assets essential for them to be cost effective</li> </ul>	<ul style="list-style-type: none"> <li>▶ Allows (but does not require) distribution utility to act as natural aggregator <ul style="list-style-type: none"> <li>■ <i>address local constraints while representing the resource to the bulk grid</i></li> </ul> </li> </ul>
<ul style="list-style-type: none"> <li>▶ Stability &amp; controllability</li> </ul>	<ul style="list-style-type: none"> <li>▶ Feedback provides predictable, smooth, stable response from distributed assets</li> <li>▶ Creates what is effectively closed loop control needed by grid operators</li> </ul>



# **PNNL Transactive Energy Approach: *Transactive Control & Coordination* (TC2)**

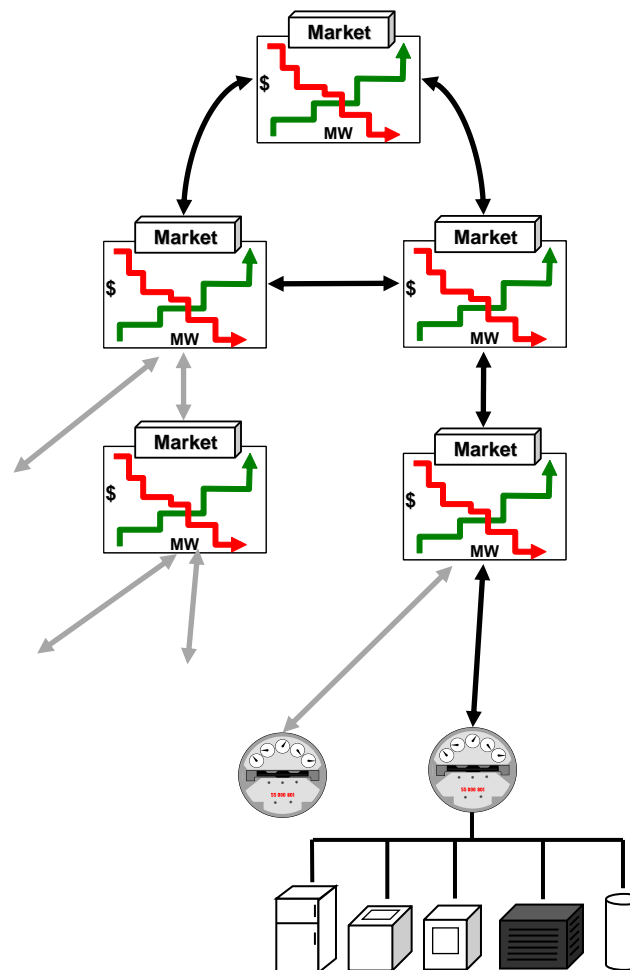
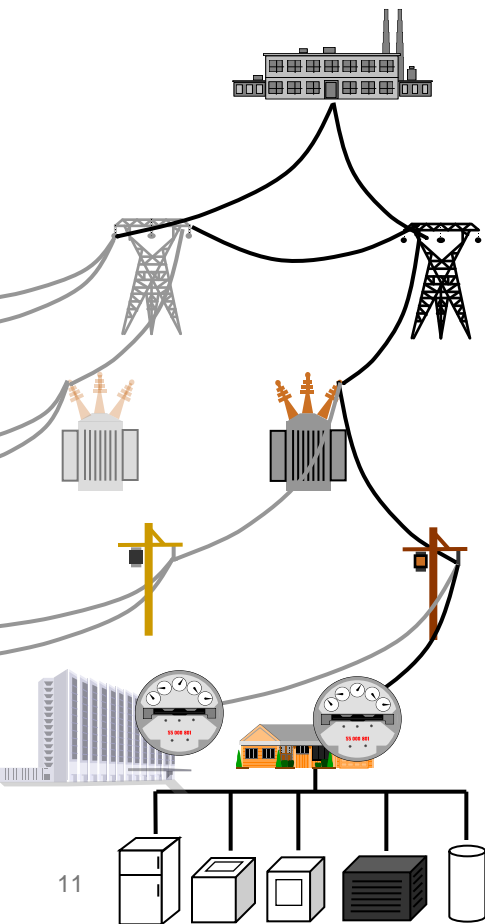
# Transactive Control from Interaction of Price Discovery & Customer Bidding Algorithms

***Precise, stable control of congested grid nodes derived from customer price-responsive bidding algorithm interacting with price discovery mechanism (e.g., a market)***



# Hierarchical Network of Transactive Nodes Parallels the Grid Infrastructure

**Node:** point in the grid where flow of power needs to be managed



## Node Functionality:

- ▶ “Contract” for power it needs from the nodes supplying it
- ▶ “Offer” power to the nodes it supplies
- ▶ Resolve price (or cost) & quantity through a price discovery process
  - market clearing, for example
- ▶ Implement internal price-responsive controls

# Properties of Transactive Nodes

- ▶ Use local conditions & global information to make control decisions for its own operation
- ▶ Indicate their response to the network node(s) serving them
  - to an *incentive signal* from the node(s) serving them
  - as a *feedback signal* forecasting their projected net flow of electricity (production, delivery, or consumption)
- ▶ Setting incentive signal for nodes serves to obtain precise response from them, based on their feedback signals
- ▶ Responsiveness is voluntary (set by the node owner)
- ▶ Response is typically automated (and reflected in the feedback signal)

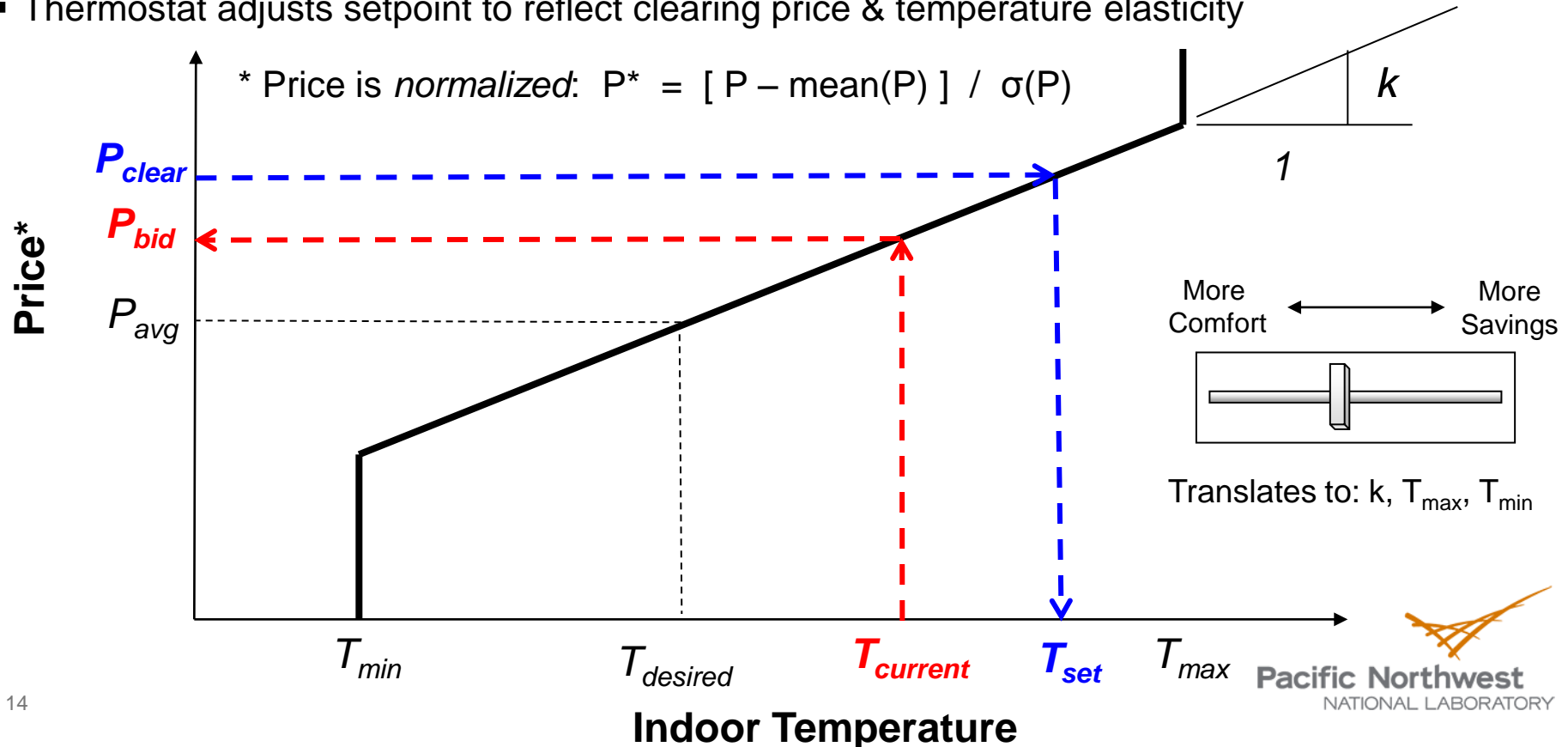
# Links All Values/Benefits in Multi-Objective Control

## **Long-term objective for TC2 is to simultaneously achieve combined benefits**

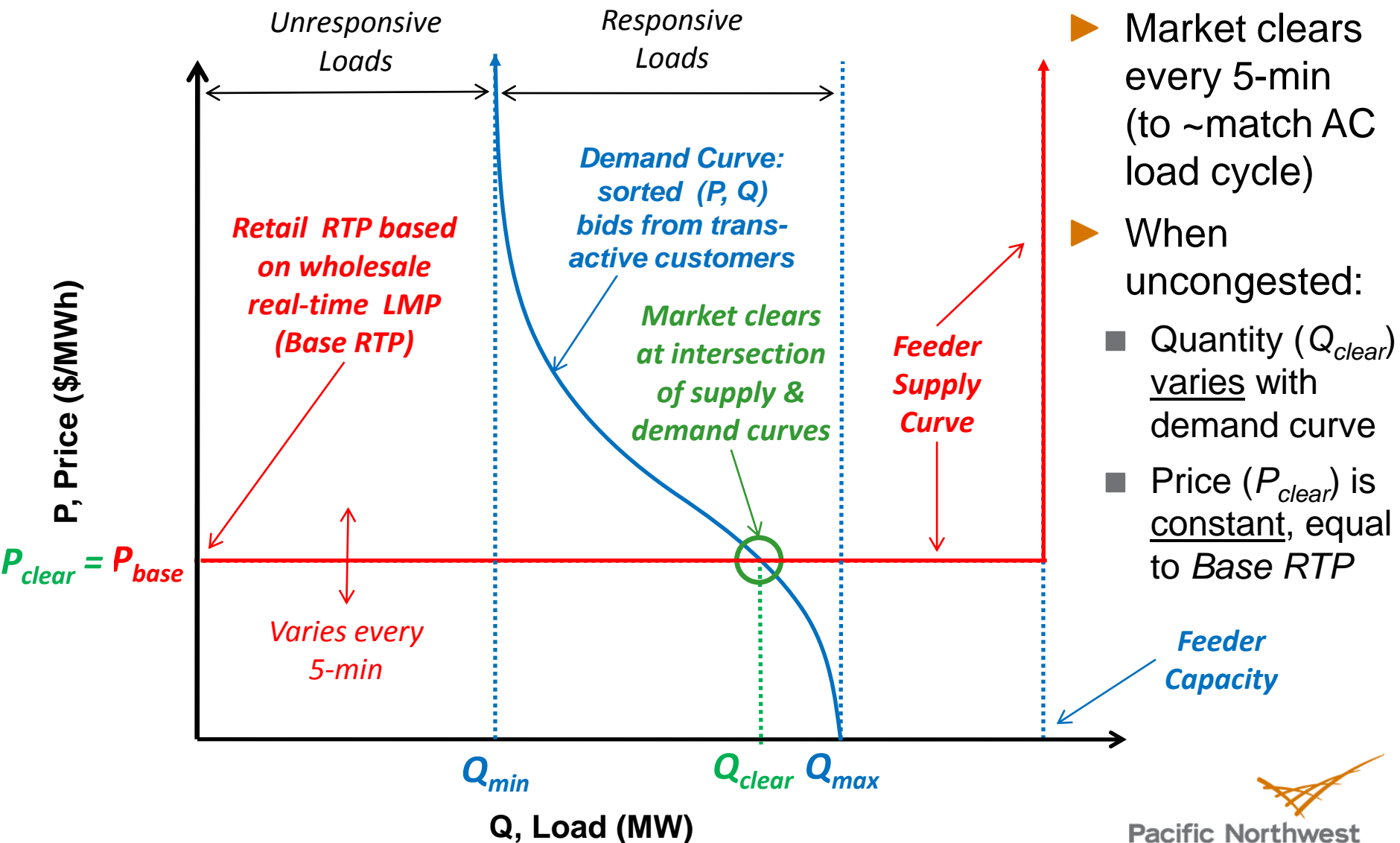
- ▶ Reduce peak loads (minimize new capacity, maximize asset utilization) – generation, transmission, & distribution
- ▶ Minimize wholesale prices/production costs
- ▶ Reduce transmission congestion costs
- ▶ Provide stabilizing services on dynamically-constrained transmission lines to free up capacity for renewables
- ▶ Provide ancillary services, ramping, & balancing (especially in light of renewables)
- ▶ Managing distribution voltages in light of rapid fluctuations in rooftop solar PV system output

# Transactive Cooling Thermostat Generates Demand Bid based on Customer Settings

- User's *comfort/savings* setting implies limits around normal setpoint ( $T_{desired}$ ), *temp. elasticity* ( $k$ )
- Current temperature used to generate bid price at which AC will “run”
- AMI history can be used to estimate bid quantity (AC power)
- Market sorts bids & quantities into demand curve, clears market returns clearing price
- Thermostat adjusts setpoint to reflect clearing price & temperature elasticity



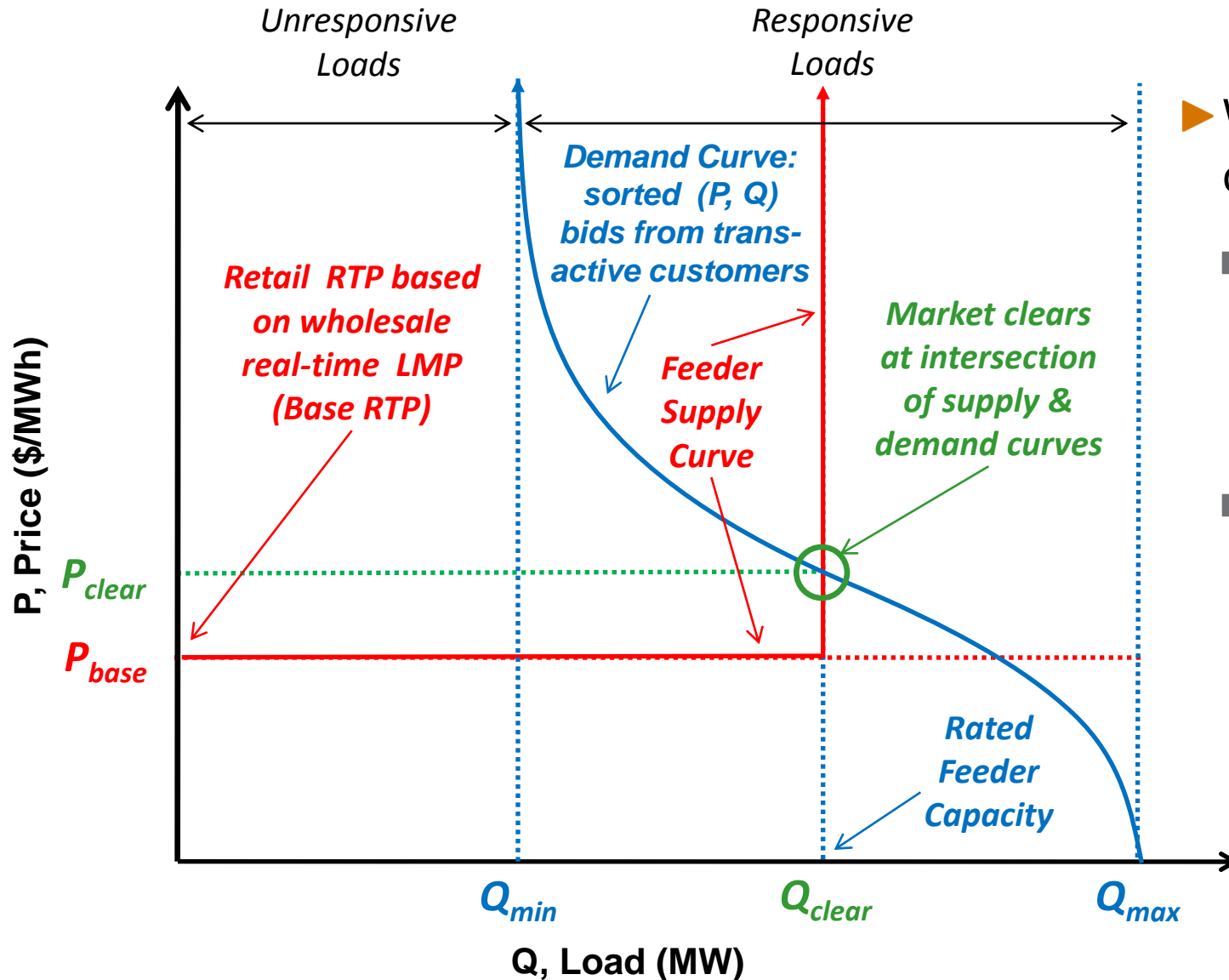
# RTP Double Auction Market – *Uncongested*



- ▶ Market clears every 5-min (to ~match AC load cycle)
- ▶ When uncongested:
  - Quantity ( $Q_{clear}$ ) varies with demand curve
  - Price ( $P_{clear}$ ) is constant, equal to *Base RTP*



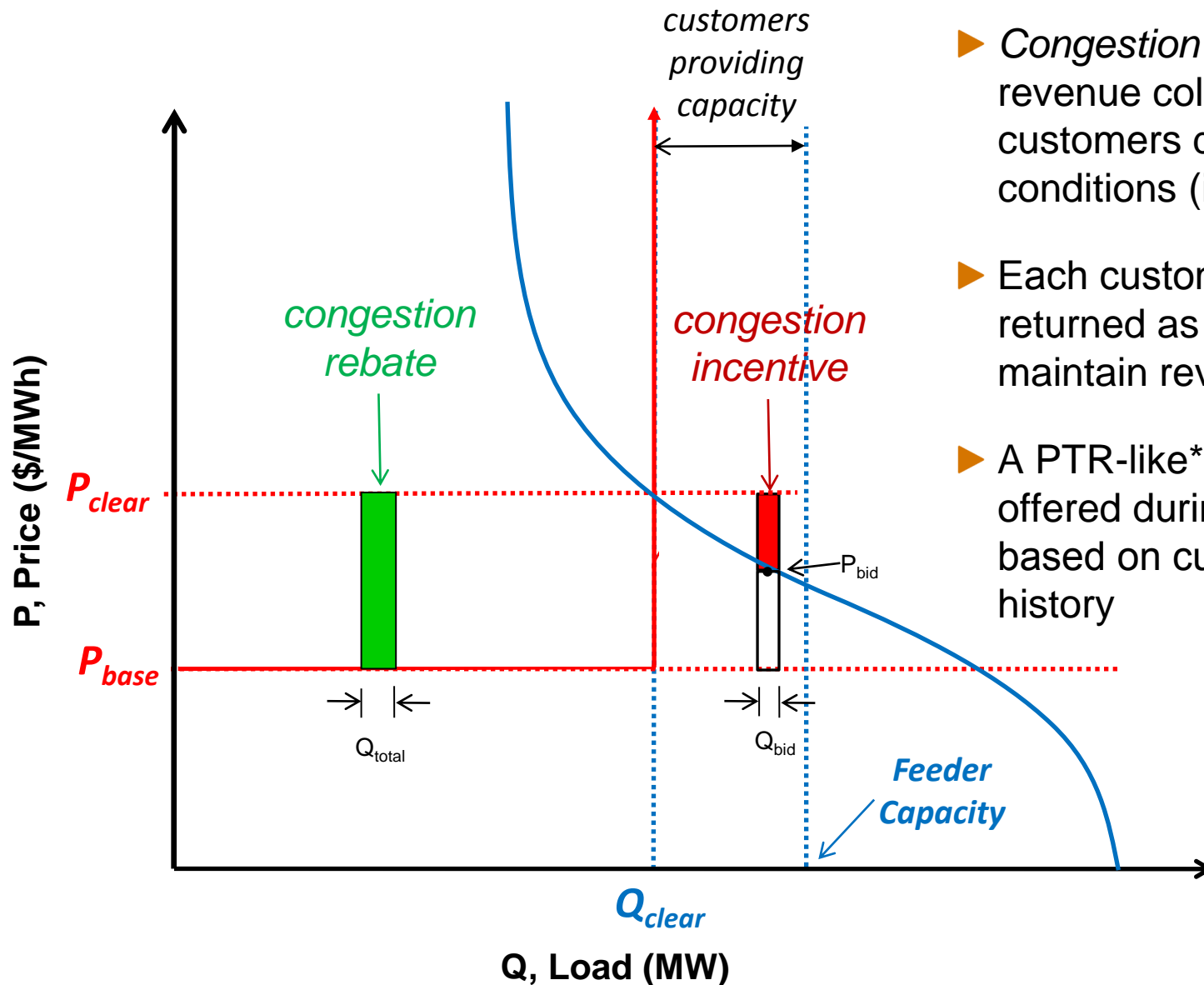
# RTP Double Auction Market – Congested



► When constrained:

- Quantity ( $Q_{clear}$ ) is constant at rated feeder capacity
- Price ( $P_{clear}$ ) varies to keep load at rated capacity

# What about the Congestion Surplus?



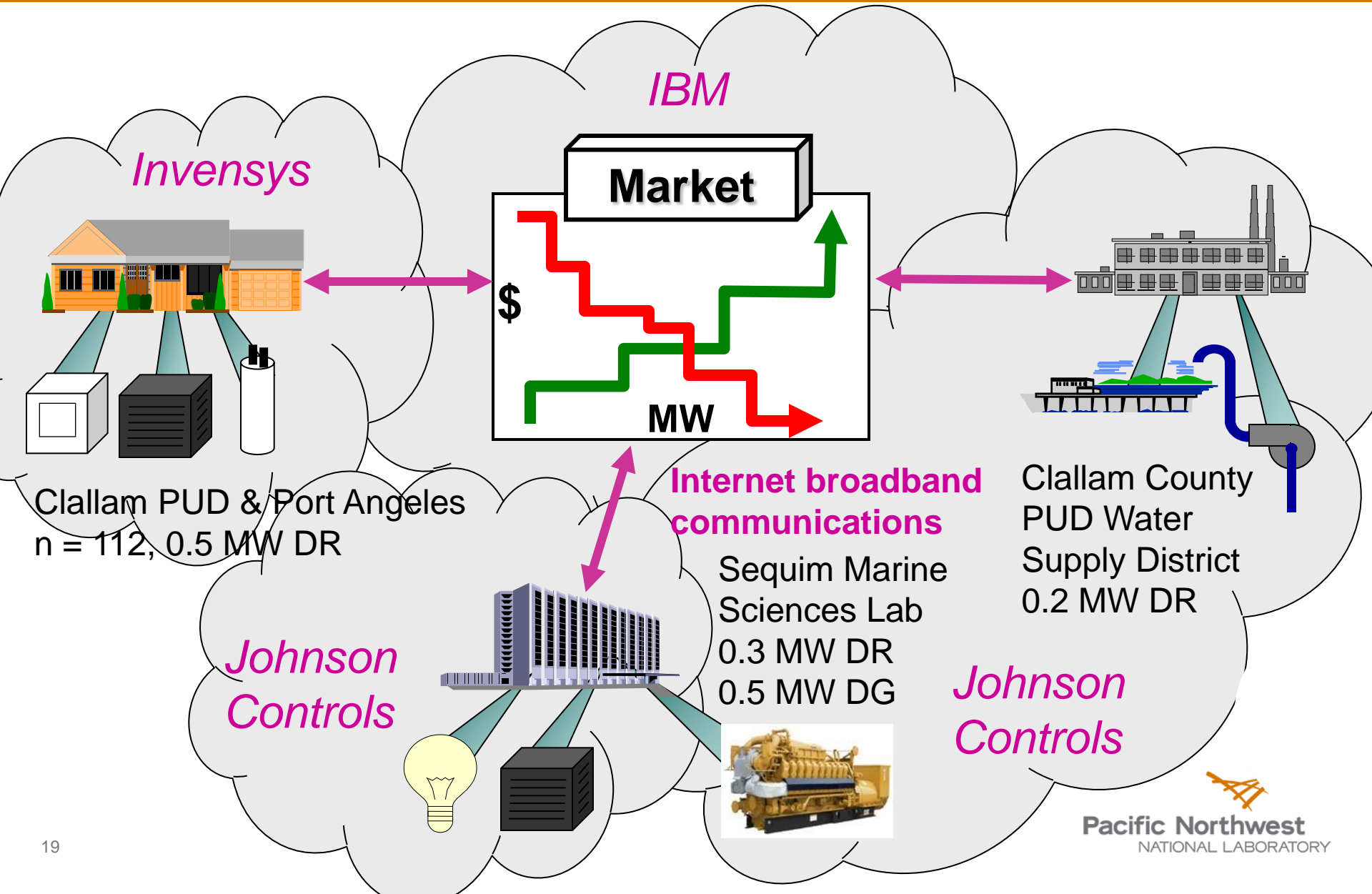
- ▶ Congestion surplus is extra revenue collected from customers during constrained conditions (i.e.  $P_{clear} > P_{base}$ )
- ▶ Each customer's surplus returned as billing rebate to maintain revenue neutrality
- ▶ A PTR-like\* incentive is also offered during congestion, based on customer's bid history

\* peak time rebate

# Fully Engaging Demand: What We've Learned from the Olympic Peninsula Demonstration



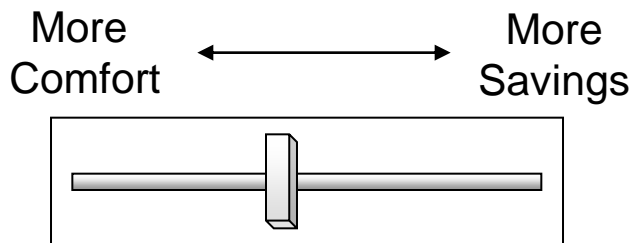
# Olympic Peninsula Demonstration



# Olympic Peninsula Demo: Key Findings (1)

Customers can be recruited, retained, and will respond to *dynamic pricing* schemes **if they are offered**:

- ▶ Opportunity for significant savings (~10% was suggested)
- ▶ A “no-lose” proposition compared to a fixed rate
- ▶ Control over how much they choose to respond, with which end uses, and a 24-hour override
  - prevents fatigue: reduced participation if called upon too often
- ▶ Technology that automates their desired level of response
- ▶ A simple, intuitive, semantic interface to automate their response



***Translates to control parameters:***

$K, T_{max}, T_{min}$  (see *Virtual Thermostat*)



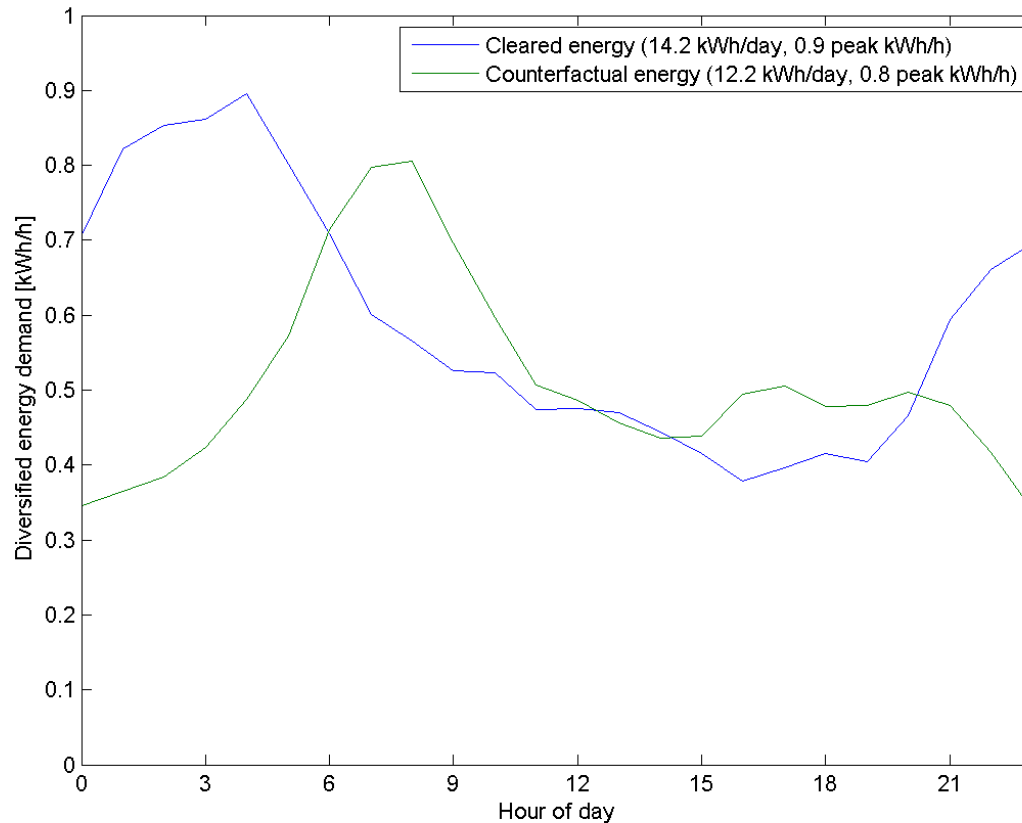
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# Olympic Peninsula Demo: Key Findings (2)

Significant demand response was obtained:

- ▶ 15% reduction of peak load
- ▶ Up to 50% reduction in total load for several days in a row during shoulder periods
- ▶ Response to wholesale prices + transmission congestion + distribution congestion
- ▶ Able to cap net demand at an arbitrary level to manage local distribution constraint
- ▶ Short-term response capability could provide regulation, other ancillary services adds significant value at very low impact and low cost)
- ▶ Same signals integrated commercial & institutional loads, distributed resources (backup generators)

# Load Shifting Results for RTP Customers



- ▶ Winter peak load shifted by pre-heating
- ▶ Resulting new peak load at 3 AM is non-coincident with system peak at 7 AM
- ▶ Illustrates key finding that a portfolio of contract types may be optimal – i.e., we don't want to just create a new peak